# Modeling the selective partitioning of cations into negatively charged nanopores in water

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## **Abstract**

Partitioning and transport of water and small solutes into and through nanopores is important to a variety of chemical and biological processes and applications. Here we study water structure in negatively charged model cylindrical [carbon nanotube (CNT)-like] nanopores as well as the partitioning of positive ions of increasing size  $(Na^+, K^+, \text{ and } Cs^+)$  into the pore interior using extensive molecular dynamics simulations. Despite the simplicity of the simulation system – containing a short CNT-like nanopore in water carrying a uniformly distributed charge of  $q_{pore} = -ne$  surrounded by n = (0, ..., 8) cations, making the overall system charge-neutral - the results provide new and useful insights on both the pore hydration and ion partitioning. For n=0, that is, for a neutral nanopore, water molecules partition into the pore and form single-file hydrogen-bonded wire spanning the pore length. With increasing n, water molecules enter the pore from both ends with preferred orientations, resulting in a mutual repulsion between oriented waters at the pore center, and creating a cavity-like low density region at the center. For low negative charge densities on the pore, the driving force for partitioning of positive ions into the pore is weak, and no partitioning is observed. Increasing the pore charge gradually leads to partitioning of positive ions into the pore. Interestingly, over a range of intermediate negative charge densities, nanopores display both thermodynamic as well as kinetic selectivity toward partitioning of the larger  $K^+$  and  $Cs^+$  ions into their interior over the smaller  $Na^+$  ions. Specifically, the driving force is in the order  $K^+ > Cs^+ > Na^+$ , and  $K^+$  and  $Cs^+$ ions enter the pore much more rapidly than  $Na^+$  ions. At higher charge densities, the driving force for partitioning increases for all cations – it is highest for  $K^+$  ions, and becomes similar for  $Na^+$  and  $Cs^+$ ions. The variation of thermodynamic driving force and the average partitioning time with the pore charge density together suggest the presence of free energy barriers in the partitioning process. We discuss the role of ion hydration in the bulk and in the pore interior as well as of the pore hydration in determining the barrier heights for ion partitioning and the observed thermodynamic and kinetic selectivity.

### I. INTRODUCTION

Understanding thermodynamics and kinetics of partitioning of small molecules into nanoscopic pores or confined spaces of molecular dimensions is important to a wide range of chemical and biological processes and applications [1, 2, 3, 4]. The pores of interest can be smooth cylindrical (carbon nanotube-like) [5] or slit-pores (between flat surfaces) [6], or may have complex geometries as observed in biological pores [7, 8], in activated carbon, and in other nanoporous materials [9]. When exposed to solution, such materials can selectively extract and/or allow transport of specific solute molecules into and through their pores, depending on the pore-solvent, pore-solute, and solute-solvent interactions. Successful bottom-up design of such selective systems can be aided by fundamental understanding of the interplay of these interactions in idealized model systems. Molecular dynamics simulations are an excellent tool to build and simulate such model systems aimed at fundamental understanding.

Here we are interested in partitioning of simple spherically symmetric ionic solutes into interior of charged hollow cylindrical pores of well defined dimensions in the nanometer range. Such a model system is relevant not only to electrostatically driven molecular separations or nanofluidic applications, but also to development of energy storage devices, such as carbon supercapacitors, that use ion adsorption on the surface of highly porous materials to store charge. A recent experimental study by Chmiola et al. [10] shows that carbide-derived carbon materials with pore sizes from 0.6 to 2.25 nm when used as a negative electrode, can partition tetraethylammonium cations (~0.68 nm in diameter) into the pore. The closer approach of partially dehydrated cations to the nanoporous electrode surface leads to significantly enhanced capacitance of these materials.

Our simulation system contains a nanopore (modeled by a carbon nanotube-like cylindrical pore) in water carrying a uniformly distributed charge of  $q_{pore} = -ne$  surrounded by  $n \in \{0,\dots,8\}$  cations (either  $Na^+$ ,  $K^+$ , or  $Cs^+$ ), making the overall system charge-neutral. We perform extensive nonequilibrium simulations focused on the kinetics of partitioning, which show that negatively charged nanopores can be selective toward partitioning of the larger  $K^+$  and  $Cs^+$  ions and can exclude the smaller  $Na^+$  ions over a range of nanopore charge densities. We complement those simulations with equilibrium free energy calculations of ion hydration in bulk water and in the hydrated nanopore interior. These calculations along with analysis of ion hydration shell fluctuations highlight the role of free energy barriers as well as equilibrium free energy of partitioning which together are expected to govern the rate of ion transport through selective pores.

#### II. SIMULATION DETAILS

Simulations of ion partitioning into nanopores: We used a piece of (5,5) armchair carbon nanotube (CNT)-like pore comprising 100 carbons [with the pore diameter (i.e., C-C distance) of 6.7 Å and length 11 Å] as a model cylindrical pore. A total charge of  $q_{pore} = -ne$  (where e is the magnitude of electronic charge) was distributed uniformly on the pore atoms, such that each atom carries a charge of -ne/100. The nanopore was placed in a solution containing 500 explicit water molecules and n cations, thus, making the overall system electrically neutral. Note that our goal is not to model specifically a CNT, but use its cylindrical geometry as a model for a cylindrical pore. A realistic model of CNT would need to consider the chemistry of rim atoms, non-uniform distribution of charges (in case of charged nanotubes) [11], etc.

The present systems contain n cations, but no explicit anions (the pore with its -ne charge acts as a large anion). In realistic systems, anions (e.g., chloride ions) will be present in the salt solution. For n=5, we simulated the present system with excess salt (i.e., with additional few pairs of NaCl, KCl, or CsCl) ions. The results on partitioning of cations in this system were similar to the ones reported here, suggesting that the trends on partitioning reported here will be unaffected.

Simulations were performed using AMBER6.0 [12], using TIP3P [13] model of water, and Lennard Jonesium (LJ) description of carbon (atom type CA) [12, 14]. Ions were represented as LJ spheres with ion charge placed at the center [15]:  $\sigma_{Na} = 2.530$  Å,  $\epsilon_{Na} = 0.06184$  kJ/mol,  $\sigma_{K} = 5.874$  Å,  $\epsilon_{K} = 0.0000568$  kJ/mol, and  $\sigma_{Cs} = 6.0492$  Å,  $\epsilon_{Cs} = 0.0003372$  kJ/mol. Ionwater and ion-carbon LJ interactions were calculated using Lorentz-Berthelot mixing rules [16]. Periodic boundary conditions were applied and the particle mesh Ewald method [17] was used to calculate the electrostatic interactions with a grid spacing of 1 Å. Temperature and pressure were maintained at 300 K and 1 atm, respectively, using the Berendsen method [18]. A time step of 1 fs was used in all the simulations.

Selective partitioning of cations into nanopores: A given system contains a carbon nanotube-like pore carrying a total charge of  $q_{pore} = -ne$ , water, and n cations. We monitored the number of cations partitioned into the nanopore as a function of time for different values of n (see Figure 1). Separate simulations were performed for  $q_{pore} = -1e$  through -8e in steps of 1e, for each cation. At the beginning of each production run (marked t=0), each cation in the system was at least 9 Å away from the atoms of the model nanopore. To obtain an estimate of the partitioning time (or the

first passage time for partitioning), each simulation was run for a sufficiently long time. For lower charge densities on the nanopore, the electrostatic driving force is low, and extended simulations of neutral and near neutral  $(q_{pore}=-1e)$  nanopores show that ions are excluded from the pore interior, consistent with previous studies [19, 20, 21]. For higher charge densities on the pore, not only is the electrostatic driving force higher, but the ion concentration outside the tube is slightly higher as well (by the way the system is constructed), which likely further increases the driving force. Thus, with increasing n we expect ions to partition into the pore, with the time required for partitioning decreasing with the pore charge density. Correspondingly, for  $|q_{pore}| \ge 2e$  simulations were performed for 24/n nanoseconds each.

#### III. RESULTS AND DISCUSSION

Kinetics of ion partitioning: Figure 1 shows the number of cations partitioned into the pore for various charge states of the pore observed in different nonequilibrium simulation runs. For  $q_{pore}=-2e$ , the charge density on the nanopore is sufficiently small and none of the ions partitions into the pore over the timescale of 12 ns. It is only for  $q_{pore}=-5e$  we observe partitioning of one  $Na^+$  ion into the pore in the specific set of runs shown in Figure 1. In contrast,  $Cs^+$  and  $K^+$  ions partition into the pore for  $|q_{pore}| \geq 3e$ . At higher values of  $|q_{pore}|$ , we observe partitioning of the second and third (in case of  $K^+$ ) cation into the charged nanopore. To obtain more quantitative estimates of the kinetics of partitioning, we performed 10 independent nonequilibrium simulations for each ion type starting with different initial configuration for  $q_{pore} = -4e$ , -5e, and -6e. Each of these simulations were run until the first cation partitions well into the pore, which for  $q_{pore}=-4e$  was longer than 25-30 ns each for several runs with  $Na^+$  ions. We define  $\tau_1$  as the waiting time for the first cation to partition into the nanopore. Table I lists average,  $\langle \tau_1 \rangle$ , and standard deviation,  $\sigma_{\tau_1}$ , of the waiting time distribution obtained from 10 simulations. Although a larger number of simulations may be needed to obtain more accurate estimates of waiting time distributions, trends in our data are already clear and interesting. For example, for  $q_{pore} = -4e$ ,  $Na^+$  ion takes  $\sim$ 25 times longer to partition into the pore ( $\sim$ 18 ns) compared to that for  $K^+$  and  $Cs^+$  ions ( $\sim$ 0.7-0.8 ns). As the charge on the nanopore is increased, partitioning of  $Na^+$  occurs over shorter timescales, and correspondingly, the  $\tau_1$  values for both  $K^+$  and  $Cs^+$  ions are small and decrease somewhat further. Thus, from kinetic perspective, over a range of charge densities, the nanopore is selective toward partitioning of the larger ions  $K^+$  and  $Cs^+$  over the smaller ion

 $Na^+$ , and increasing the driving force significantly (i.e., increasing  $|q_{pore}|$ ) appears to decrease that selectivity somewhat. To understand the ion partitioning at a more fundamental level, we investigate below the structural and thermodynamic aspects of the partitioning process.

Water structure in neutral and charged pores: Filling and emptying transitions of water into neutral nanotubes have been studied previously [2, 22]. For the carbon-water LJ parameters used here, water molecules partition into the tube and form a single-file hydrogen bonded wire, in which each water molecule donates and accepts one hydrogen bond to and from its neighbors on the left and right (Figure 2a). The length of the tube is such that only four water molecules completely fit inside the tube. However, the hydrogen-bonding interactions of the boundary water molecules with those inside the tube are sufficiently strong. As a result, one water molecule on each side of the tube also maintains its position and orientation consistent with those in the tube. Correspondingly, the water density profile along the tube axis shows six clearly defined peaks (Figure 2b).

Water molecules in the hydrogen-bonded wire have one of their OH bond vectors aligned approximately with the pore axis and pointing in the positive Z direction. Properties of such hydrogen bonded wires have been studied especially for their ability to transport protons at fast rates [23]. The dipole vector OM of each water molecule makes an angle of  $\sim$ 35 degrees with the pore axis [ $\langle cos\theta \rangle \approx 0.82$ ] (Figure 2c). We note that the mirror image of the chain with all OH vectors pointing in the negative Z direction is equally likely due to two-fold symmetry [22].

The effects of charging the nanopore on the structure of water inside the pore are interesting. For  $q_{pore} = -2e$ , that is, when the charge on each carbon is -0.02e, water molecules enter the pore with both of their hydrogen atoms pointing inward and the HOH planes roughly parallel to the pore axis (Figure 2a) [22]. As the chains from the two ends meet at the center, there is significant electrostatic repulsion between them. As a result, water density is depressed at the center of the pore as indicated by the significant reduction in the heights of the two central peaks (Figure 2b). Water is effectively expelled from that region, creating a molecular scale void or a cavity. This expulsion in similar to that observed recently in simulations of charged plates in water [24]. The other peaks are also less well defined. As the charge on the nanopore is increased, the stronger water-nanopore interactions lead to a partial filling of the internal cavity. In the interior of these charged nanopores, water molecules flip the orientation as we traverse the pore from left to right as indicated by the  $\langle cos\theta \rangle$  profile (Figure 2c). A similar change in orientation of water molecules is observed in the aquaporin protein channel, which has positively charged regions at the opening and the exit to block transport of protons [7, 25].

The low density region at the center of a charged pore is only a few angstroms wide and presents an ideal location for cations partitioned into the pore. The lower water density in the cation sized region ensures lower repulsive interactions without the loss of attractive interactions with vicinal waters. Indeed, analysis of density distribution of cations confirms that the most favorable position for the partitioned cations is at the pore center. The cation-water electrostatic interactions are strong and affect orientations of the vicinal waters. Figure 3 shows the effects of competitive water-water, water-nanopore, and water-cation interactions on water orientations. When the charge on the cation at the pore center is turned off, e.g., for  $K^0$ Pore<sup>-2e</sup> case, water orientations are dictated solely by the water-nanopore electrostatic interactions. However, when the charge on the potassium ion is turned on, i.e., for the  $K^{+1}$ Pore<sup>-2e</sup> case, the water-potassium interactions dominate and flip the orientations of two vicinal water molecules such that their oxygens point toward the  $K^+$  ion. Interestingly, the repulsion between these two water molecules in ion's shell and others located at the pore ends leads to a low density area at the pore entry (see Figure 3c). When the nanopore charge is increased to -5e, the water-nanopore interactions become comparable to water-potassium interactions, and only the two water molecules vicinal to the  $K^+$  ion point their oxygens toward the ion, and the pore entry region gets filled again (Figure 3d).

Thermodynamics of ion partitioning: The free energy of ion transfer from bulk water to nanopore interior quantifies the thermodynamic driving force for ion partitioning. The excess free energy of hydration,  $\mu_{hyd}^{ex}$ , can be divided into two parts:  $\mu_{hyd}^{ex} = \mu_{LJ}^{ex} + \mu_{ele}^{ex}$ , where  $\mu_{LJ}^{ex}$  is the excess chemical potential of hydration of electrically neutral LJ solutes, and  $\mu_{ele}^{ex}$  is the free energy of charging that solute to its final charge state (+1e here). We used test particle insertions [26, 27] of neutral LJ solutes in bulk water and at the center of a charged hydrated nanopore to obtain the  $\mu_{LJ}^{ex}$  contribution. As described previously in detail [28, 29], calculation of the  $\mu_{ele}^{ex}$  was done using the cumulant expansion method which requires two simulations, one in the uncharged and another in the fully charged state of the solute in bulk water as well as in the nanopore interior. Such calculations were performed for all three cations for nanopore charge of -2e, -5e, and -8e. For reference, we also calculated  $\mu_{LJ}^{ex}$  and  $\mu_{ele}^{ex}$  contributions in a system containing a charged nanopore in vacuum, in the absence of water molecules. Comparison of these values to those in the hydrated nanopore systems provides insights into the role of water in ion solvation, especially in the confining pore interior region.

Table II lists values  $\mu_{LJ}^{ex}$  and  $\mu_{ele}^{ex}$  for  $Na^+$ ,  $K^+$ , and  $Cs^+$  ions in bulk water, in the hydrated nanopore interior, and at the center of nanopore in vacuum for different charge states of the

nanopore. In bulk water, the  $\mu_{LJ}^{ex}$  is smallest (i.e., most favorable) for  $Na^+$  ion, and increases with the ion size. This is expected because the  $\mu_{LJ}^{ex}$  is dominated by repulsive interactions (or the cavity formation process). Compared to that in bulk water,  $\mu_{LJ}^{ex}$  value in the interior of the hydrated nanopore with -2e charge is smaller for  $Na^+$  ion (expected), somewhat higher for  $K^+$  ion, and almost doubles of the  $Cs^+$  ion (unexpected). This is surprising because we expect that the presence of a low density region in the hydrated nanopore will reduce, and not increase the  $\mu_{LJ}^{ex}$  value for all ions. The trends become clear, however, when we consider  $\mu_{LJ}^{ex}$  calculated for ions in a nanopore in vacuum. They indicate that the interior pore of the (5,5) nanopore used here is small; it is large enough to accommodate  $Na^+$  ion comfortably, but overlaps slightly with the  $K^+$  ion, and significantly with the  $Cs^+$  ion.

The advantage arising from the presence of a cavity at the center of the hydrated nanopores becomes clear when we compare the sum of  $\mu_{LJ}^{ex}$  in bulk water and in bare nanopore to that in hydrated nanopore. For all ions, that value in hydrated nanopores is smaller than the sum of bulk water and bare nanopore values. Only for the highest charge density on the nanopore, the two approach each other as the central cavity gets gradually filled with water. Thus, based on differences between  $\mu_{LJ}^{ex}$  in bulk water and in the hydrated nanopore, we would expect the hydrated nanopore interior to be most favorable for the smallest  $Na^+$  ion and least favorable for the largest  $Cs^+$  ion. This is contrary to the kinetic behavior observed in Figure 1. To understand the role of electrostatic interactions and of hydration, below we focus on differences in  $\mu_{ele}^{ex}$  contribution for the three ions.

Table II shows that in bulk water phase,  $\mu_{ele}^{ex}$  is large and negative (i.e., favorable) for all ions. It is most favorable for  $Na^+$  ion, equal to -420 kJ/mol, and decreases in magnitude as the ion size increases, consistent with previous calculations [30]. In vacuum, the electrostatic interaction between cations and the negatively charged nanopore is highly favorable and is almost identical for all ions. Minor differences in the energy values in vacuum arise due to slight differences in the location of ions. Ions are placed at their most probable locations obtained from ion partitioning data in the hydrated charged nanopores. The charging free energy of ions in the hydrated charged nanopores is also large and negative. However, its magnitude is smaller than that in vacuum calculations. In the charged and hydrated nanopore, water molecules from either side point their hydrogen atoms toward the center. Charging of a neutral LJ solute located at the center to +1e charge partially reorients those water molecules to more favorable ion-water configurations. This effect can be viewed as "competitive solvation", where the cation and the pore both compete for

the same water molecules for their solvation. As a result, although the net value of  $\mu_{ele}^{ex}$  for ion solvation is negative, it is smaller in magnitude compared to that inside the nanopore in vacuum. Sodium ion, with its small size, and higher charge density is able to fit in, as well as orient vicinal water molecules in the pore such that the overall reduction (compared to that in vacuum) is smaller compared to that for potassium and cesium ions.

The sum,  $\mu_{hyd}^{ex} = \mu_{LJ}^{ex} + \mu_{ele}^{ex}$ , determines the overall driving force for ion partitioning into the pore. The difference of ion hydration free energy in the hydrated nanopore interior and in bulk water is the water-to-nanopore transfer free energy, and is listed in Table III as well as shown in Figure 4 for different charge states of the nanopore. For  $q_{pore} = -2e$ , the transfer free energy for all ions is positive (unfavorable) consistent with the observation from Figure 1 that none of the ions partitions into the pore over 12 ns timescale. For  $Na^+$  and  $K^+$  ions, the electrostatic contribution is unfavorable; that is, the overall ion-water-nanopore interactions do not compensate for the loss of ion-water interactions in the bulk water. In contrast, for  $Cs^+$  ion, it is the  $\Delta\mu_{LJ}^{ex}$  contribution that is unfavorable as expected from the somewhat larger size of that ion relative to the nanopore internal diameter.

Increasing the charge density on the nanopore increases the strength of cation-nanopore interactions, making the pore interior increasingly favorable for all three cations. At a sufficiently high value of nanopore charge (e.g.,  $q_{pore} = -5e$ ), the ion-nanopore electrostatic interactions are large and negative for all ions indicating that it is thermodynamically favorable for all three types of ions to partition into the pore. The free energy varies approximately linearly with the nanopore charge, and the threshold value of charge at which the transfer free energy changes from positive to negative can be estimated from Figure 4. That threshold charge value is near -2e for  $K^+$  and  $Cs^+$  ions, and somewhat larger ( $\sim -3e$ ) for the  $Na^+$  ion. That is for nanopore charge of slightly larger than -2e, partitioning of  $K^+$  and  $Cs^+$  ions will be quite favorable, whereas that of  $Na^+$  ion unfavorable, providing a significant thermodynamic selectivity for partitioning of those larger ions over the smaller  $Na^+$  ion. At high nanopore charge densities, although partitioning of all ions into the nanopore is favorable, the  $K^+$  ions appears to benefit from its optimal size (compared to the nanopore diameter) and corresponding hydration free energy in water. The balance of LJ and electrostatic interactions for  $K^+$  ion in bulk water and in the nanopore interior are such that its partitioning is most favored at higher nanopore charge densities.

Based on the large thermodynamic driving force at charge densities greater than  $q_{pore}=-3e$ , we would expect partitioning of all three ions into the charged nanopores. Corresponding average

partitioning times are listed in Table I. It is clear that the timescale for partitioning of  $Na^+$  ions for  $q_{pore}=-4e$  is significantly larger than that for  $K^+$  and  $Cs^+$  ions, which partition over subnanosecond timescales. The expected partitioning of Na+ in pores with total charge of -3e would take even longer time, well beyond the scope of present simulations. Thus, the thermodynamic and kinetic data suggest the existence of a free energy barrier for the ion partitioning process, the height of which is different for different ions. Below we discuss possible physical origins of that barrier.

Possible origins of the free energy barrier based on the dehydration of ions: The diameter of the nanopore is small, just sufficient to accommodate the cations. As seen in Figure 3, only two water molecules are available for direct hydration of ions partitioned into the pore. In contrast, the number of water molecules in the hydration shell of cations in bulk water is larger, approximately 5.3, 7, and 8, for  $Na^+$ ,  $K^+$ , and  $Cs^+$  ions, respectively, consistent with previous simulation and experimental studies [31, 32, 33, 34]. Ions thus undergo significant dehydration as they partition into the nanopore. As the ion approaches the end of the nanopore from outside, the ion-nanopore interactions partially compensate for the loss of ion-water interactions. One would require numerous simulations of the partitioning process or apply a combination of methods such as the transition path sampling [35] and umbrella sampling [36, 37] to obtain detailed structural insights into the transition state, the appropriate reaction path, and the free energy along that path. We have not performed that analysis here. However, monitoring fluctuations of the number of hydration shell water molecules for cations in bulk water provides qualitative insights into the origin of the free energy barrier.

Figure 5 shows the potential of mean force,  $-\ln[p(N_{hyd})]$ , obtained from probability,  $p(N_{hyd})$ , of observing  $N_{hyd}$ , number of water molecules in the hydration shell of three different cations.  $N_{hyd}$  fluctuates between 4 and 7 for  $Na^+$  ion, with an average value of 5.3. The hydration shells of  $K^+$  and  $Cs^+$  display higher fluctuations, with  $N_{hyd}$  ranging between 4 to 10 for  $K^+$  and 4 to 12 for  $Cs^+$ , respectively. The trends in these fluctuations are consistent with ion-water radial distribution functions shown in Figure 5, which show tighter binding of water molecules to  $Na^+$  compared to that for the larger  $K^+$  or  $Cs^+$  ions. The hydration number of 2 as required in the nanopore interior is never observed spontaneously in simulations in bulk water, as the free energy of such dehydration is rather high. However, the estimated value of free energy for  $N_{hyd}=2$  in bulk water, approximately equal to 10kT for  $Cs^+$ , 11kT for  $K^+$ , and over 25kT for  $Na^+$  ion is consistent with the significantly slower partitioning of  $Na^+$  compared to  $K^+$  and  $Cs^+$  ions.

Despite this consistency, it is important to note that the dehydration free energies do not equal the free energy barrier for partitioning of these ions. The favorable ion-nanopore interactions assist the dehydration of cations, therefore reducing the barrier height. This is supported by the fact that the kinetic selectivity decreases with the increasing of the nanopore charge density. It will be interesting to investigate the exact nature of the barrier and especially the role of water structure at the pore opening in future simulation studies.

#### IV. CONCLUSIONS

Nanoporous materials with well defined pore sizes can provide excellent means to extract or separate small solutes based on steric or shape effect alone [38, 39, 40, 41, 42]. However, solvent can play an important role through differential solvation of solutes in the bulk and in the pore interior thereby providing selective partitioning of specific solutes of interest from a mixture of similarly-sized solutes. We studied the partitioning of cations  $Na^+$ ,  $K^+$  and  $Cs^+$  ions from bulk water into negatively charged model cylindrical pores with increasing pore charge density using MD simulations. Neutral and near neutral nanopores exclude ions from their interior. However, over a certain range of negative charge density on the pore, the nanopores display selectivity toward partitioning of the larger cations  $K^+$  and  $Cs^+$  over that for the smaller  $Na^+$  ion. Nonequilibrium kinetic simulations show that the partitioning is significantly slower for  $Na^+$  compared to that for  $K^+$  and  $Cs^+$  ions, especially for lower charge densities on the pore. Thermodynamic and kinetic observations collectively suggest the presence of a barrier for partitioning of cations into the nanopore interior. Such a barrier is expected to slow down the flow rates of ions through nanopores. We found that trends in free energy of dehydration of ions in bulk water are consistent with the partitioning kinetics.

Although our studies here are focused on a CNT-like model pore, the results are relevant to studies of carbon nanotubes focused on solute partitioning and transport [1, 2, 19, 22, 43, 44, 45, 46] and to complementary theoretical analyzes [47, 48, 49, 50, 51, 52, 53]. Previous studies of neutral hydrated carbon nanotubes show that water flows through their greasy interior in a frictionless manner and the flow rate is limited by the entry and exit barriers [19]. The low density region at the center of charged nanopores observed here would present an internal barrier for water transport. It will be interesting to explore to what extent such internal barriers will affect the flow rates of water through nanopores. More broadly, manipulating the balance of various interactions

through design of nanosystems and functionalization [54, 55, 56] provides a mechanism for selective partitioning, separation, or transport of solutes of interest from a mixture of molecules of similar size and shape. Lastly, the partitioning of cations into negatively charged pores of subnanometer dimensions is qualitatively consistent with the picture emerging from experimental studies of carbon supercapacitors [10]. Simulation studies of more realistic systems along these lines may aid better design of high energy storage devices.

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TABLE I: The average,  $\langle \tau_1 \rangle$ , and standard deviation  $\sigma_{\tau_1}$  of the first passage time (in ns units) for partitioning of  $Na^+$ ,  $K^+$ , and  $Cs^+$  ions into negatively charged nanopores at varying charge densities.

	nanopore (-4e)		nanopoi	re (-5 <i>e</i> )	nanopore (-6e)		
	$\langle  au_1  angle$	$\sigma_{ au_1}$	$\langle  au_1  angle$	$\sigma_{ au_1}$	$\langle  au_1  angle$	$\sigma_{ au_1}$	
$Na^+$	17.46	11.79	3.09	2.06	0.92	0.65	
$K^+$	0.66	0.50	0.72	0.52	0.14	0.04	
$Cs^+$	0.78	0.41	0.36	0.18	0.34	0.34	

TABLE II: Contributions from LJ ( $\mu_{LJ}^{ex}$ ) and electrostatic interactions ( $\mu_{ele}^{ex}$ ) to the free energy of hydration of cations in bulk water, in hydrated nanopores, and in nanopores in vacuum (the last three rows) for three different charge states of the nanopore. Units: kJ/mol

	bulk water		na	nopore (	-2e)	nanopore (-5e)			nanopore (-8e)			
	$\mu_{lj}^{ex}$	$\mu_{ele}^{ex}$	$\mu_{hyd}^{ex}$									
$Na^+$	8.9	-420.1	-411.2	1.9	-351.3	-349.4	1.8	-512.7	-510.9	2.0	-696.9	-694.9
$K^+$	22.3	-306.9	-284.5	28.2	-299.3	-271.1	29.7	-454.6	-424.9	32.1	-630.3	-598.3
$Cs^+$	29.0	-259.7	-230.7	58.4	-280.1	-221.7	61.5	-398.6	-337.1	65.2	-576.9	-511.7
$Na^+$ in nanopore in vacuum $\rightarrow$			-4.8	-442.1	-446.9	-4.8	-1017.4	-1022.2	-4.8	-1592.1	-1596.9	
$K^+$ in nanopore in vacuum $\rightarrow$			15.1	-441.3	-426.2	15.1	-1014.3	-999.2	15.1	-1588.6	-1573.5	
$Cs^+$ in nanopore in vacuum $\rightarrow$			43.0	-440.9	-397.9	43.0	-1014.4	-971.4	43.0	-1587.3	-1544.3	

TABLE III: Free energies of water-to-hydrated-nanopore transfer of cations for three charge states of the nanopore. Contributions from LJ and electrostatic interactions are also listed. Units: kJ/mol

	nanopore (-2e)			na	anopore (-5	(e)	nanopore (-8e)			
	$\Delta\mu_{lj}^{ex}$	$\Delta\mu_{ele}^{ex}$	$\Delta\mu_{hyd}^{ex}$	$\Delta\mu_{lj}^{ex}$	$\Delta\mu_{ele}^{ex}$	$\Delta\mu_{hyd}^{ex}$	$\Delta\mu_{lj}^{ex}$	$\Delta\mu_{ele}^{ex}$	$\Delta\mu_{hyd}^{ex}$	
$Na^+$	-7.0	68.8	61.8	-7.1	-92.6	-99.7	-6.9	-276.8	-283.7	
$K^+$	5.9	7.6	13.5	7.4	-147.7	-140.3	9.8	-323.4	-313.6	
$Cs^+$	29.4	-20.4	9.0	32.5	-138.9	-106.4	36.2	-317.2	-281.0	

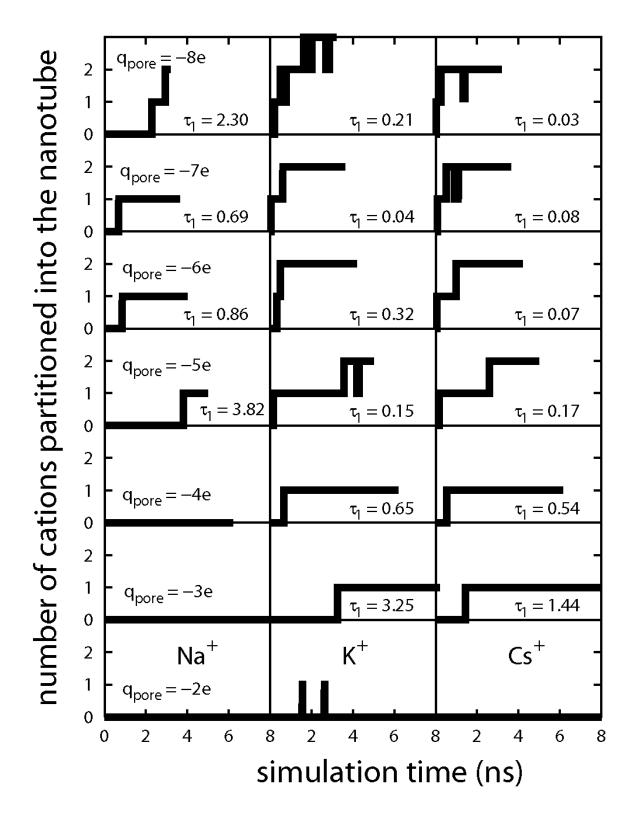


FIG. 1: Kinetics of ion partitioning from nonequilirbium MD simulations. Number of cations partitioned into the negatively charged nanopore in water as a function of time in selected simulation runs. Nanopore carries a charge of -ne,  $n=2,\ldots 8$  from bottom to top.  $\tau_i$  is the incremental time for the *i*-th cation to partition into the pore. Data for  $Na^+$  (left),  $K^+$  (middle), and  $Cs^+$  (right column) are shown.

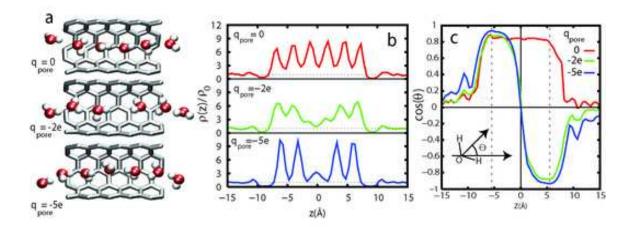


FIG. 2: Water structure in neutral and charged nanopores. (a) Snapshots of water molecules, (b) local densities, and (c) orientations of water molecules in the interior of neutral and charged nanopores carrying a total charge of -2e and -5e, respectively.  $\theta$  is the angle between dipole vector and the Z axis as shown schematically in panel (c).

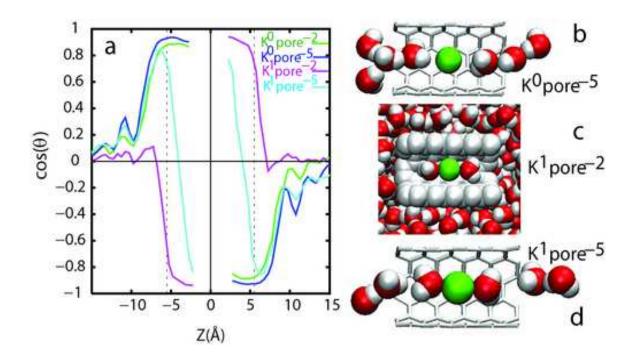


FIG. 3: Average orientational preferences of water molecules in the nanopore interior in the presence of a neutral LJ solute  $(K^0)$  or a cation  $(K^+)$  for different charge states of the nanopore. Panels (b), (c), and (d) show snapshots from simulations.

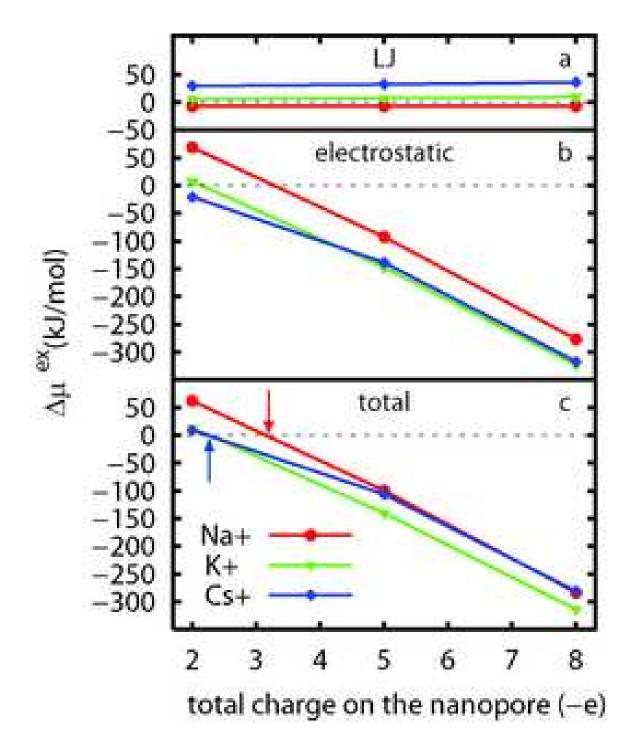


FIG. 4: Free energy,  $\Delta \mu_{hyd}^{ex}$ , of water-to-hydrated-nanopore transfer of cations. LJ and electrostatic contributions to the free energy are also listed. The threshold charge density at which the transfer free energy becomes favorable is indicated by arrows.

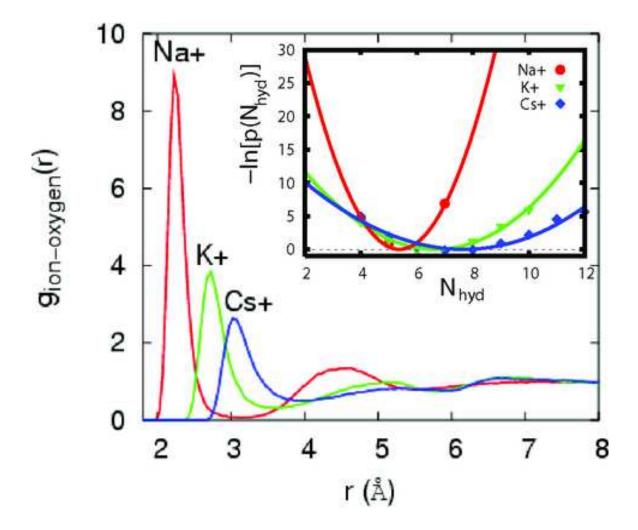


FIG. 5: Cation-water oxygen radial distribution functions obtained from MD simulations of cations in bulk water. The height of the first peak decreases significantly, indicating weaker binding of water to the ion with increasing cation size. Inset: Potential of mean force, or the free energy of spontaneous fluctuations of hydration shell waters in kT units,  $F(N_{hyd})/kT = -\ln[p(N_{hyd})]$ , where  $p(N_{hyd})$  is the probability distribution of number of hydration shell water molecules.